



Instrumentation Control  
& Intelligent Systems

# ***RNEDE: Resilient Network Design Environment***

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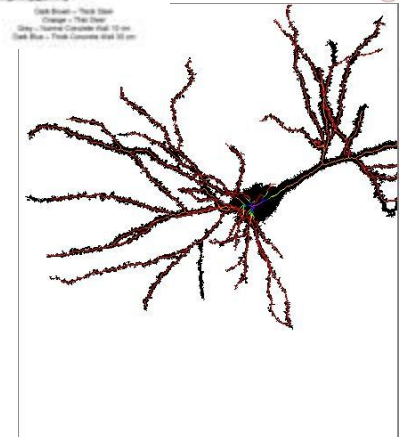
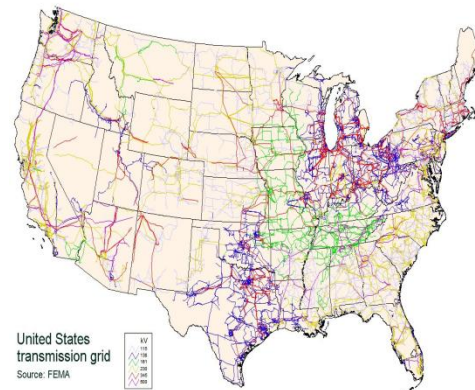
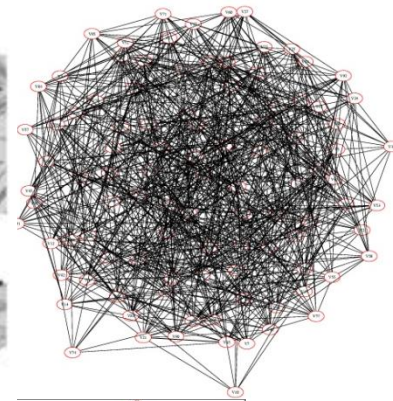
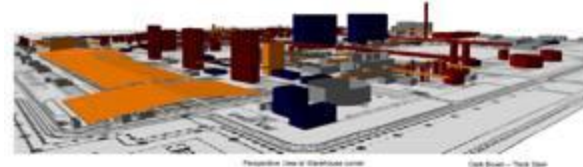
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# Motivation

- The nation's critical infrastructure is increasingly characterized by large networks
  - electrical power grids
  - road and airline systems
  - biological pathways
  - chemical plants
  - Internet



## ***Problem: Design of Resilient Topologies***

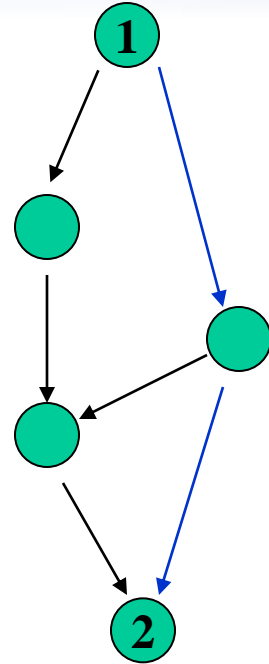
- Topology governs operational efficiency and resiliency
- How to optimize topology in the event of threats and disruptions?
  - Which remedial action must be taken?
  - Where in the current network remedial actions should be taken?
  - Whether remedial actions are even worth taking?

- Distance:
  - $d(i, j)$  = length of the *shortest* path between  $i$  and  $j$
- Average Path Length

$$\langle d \rangle = \text{Average APSP} = \frac{\sum_{i,j} d(i, j)}{n(n-1)}, \quad 1 \leq i, j \leq n$$

- **Interaction Efficiency**

- “Time or Effort” required for an exchange between agents  $i$  and  $j$
- Measured by Path length
- Smaller average path length, higher efficiency



$$Eff = \frac{1}{\langle d \rangle}$$

- Failure of one or more nodes/edges
  - *Structural* robustness:
    - Number of resulting component(s)
    - Resulting graph connected: perfectly robust
  - *Functional* robustness:
    - Efficiency of resulting component(s)
    - Average path length of resulting graph unchanged: perfectly robust
  - *Worst-case* versus *average-case*

**Overall Robustness: combination of above**

# Efficiency and Robustness

- They are often conflicting Objectives
  - Increasing efficiency often implies reducing robustness for the same cost
  - And vice versa
- Efficiency : A measure of **short-term** performance or survival
- Robustness: A measure of **long-term** performance or survival

- MST:  $e = e_{\min} = n - 1$ 
  - No *redundancy* or *excess connectivity*
- CG:  $e = e_{\max} = n(n-1)/2$ 
  - Maximum *redundancy*
- Redundancy coefficient

$$\beta = \frac{e - e_{\text{mst}}}{e_{\text{cg}} - e_{\text{mst}}} \quad 0 \leq \beta \leq 1$$

- Structural and Functional Redundancies
- Cost: measure of the economy of design
  - Assumption: All nodes and edges have equal importance
  - Cost per edge = 1, Total cost  $C = e$

- For a given environment  $\alpha$ , design a net to maximize survival fitness  $G$

$$\max G = \alpha \eta_E + (1 - \alpha) \eta_R - c_1(\beta, k) - c_2(n)$$

$\eta_E$  is the efficiency

$\eta_R$  is the robustness

$\alpha$  is a constant,  $0 \leq \alpha \leq 1$

$c_1$  is the cost function related to the addition of edges

$c_2$  is the cost function related to the addition of nodes

$k$  is the vertex degree of the node to which a new edge is being added

$\beta$  is the redundancy coefficient

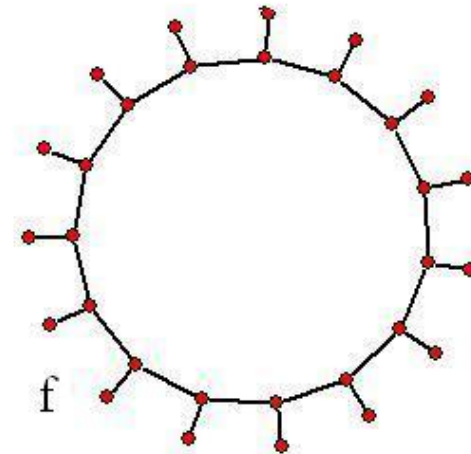
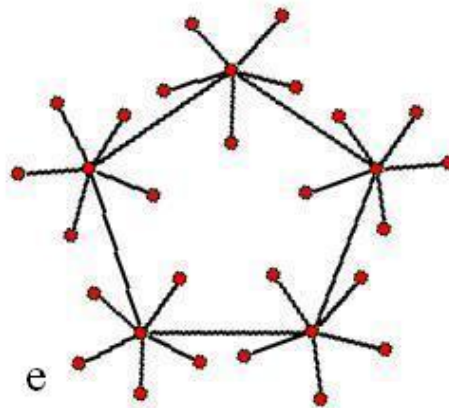
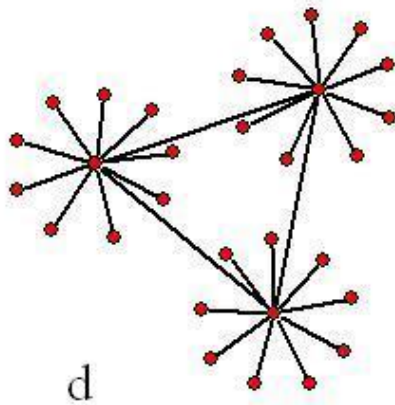
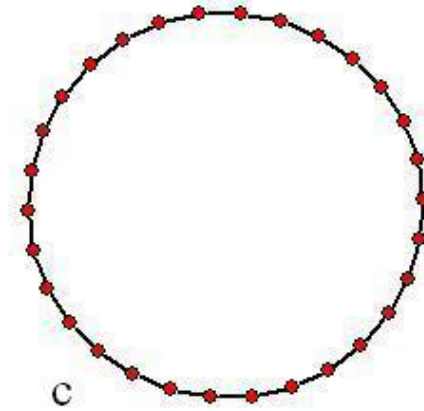
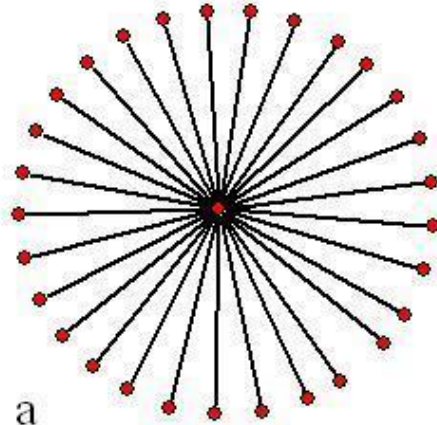
$n$  is the number of nodes

**Principle of Maximum Harmony**  
**Harmony Function  $G$**



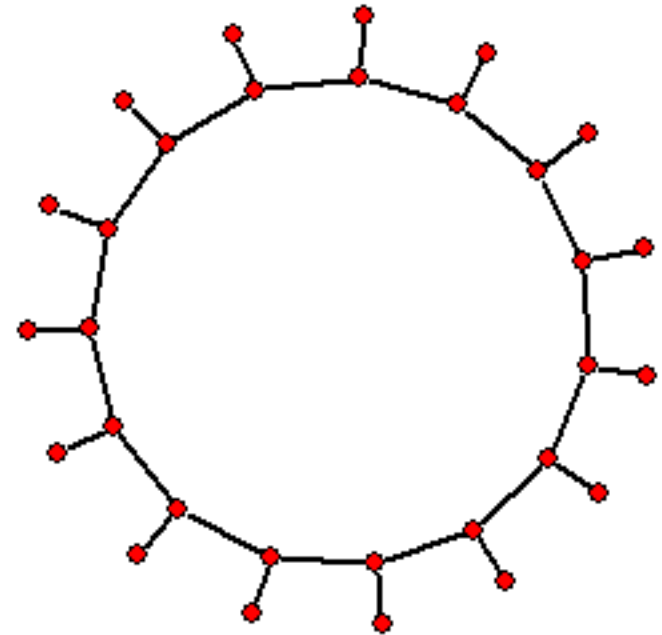
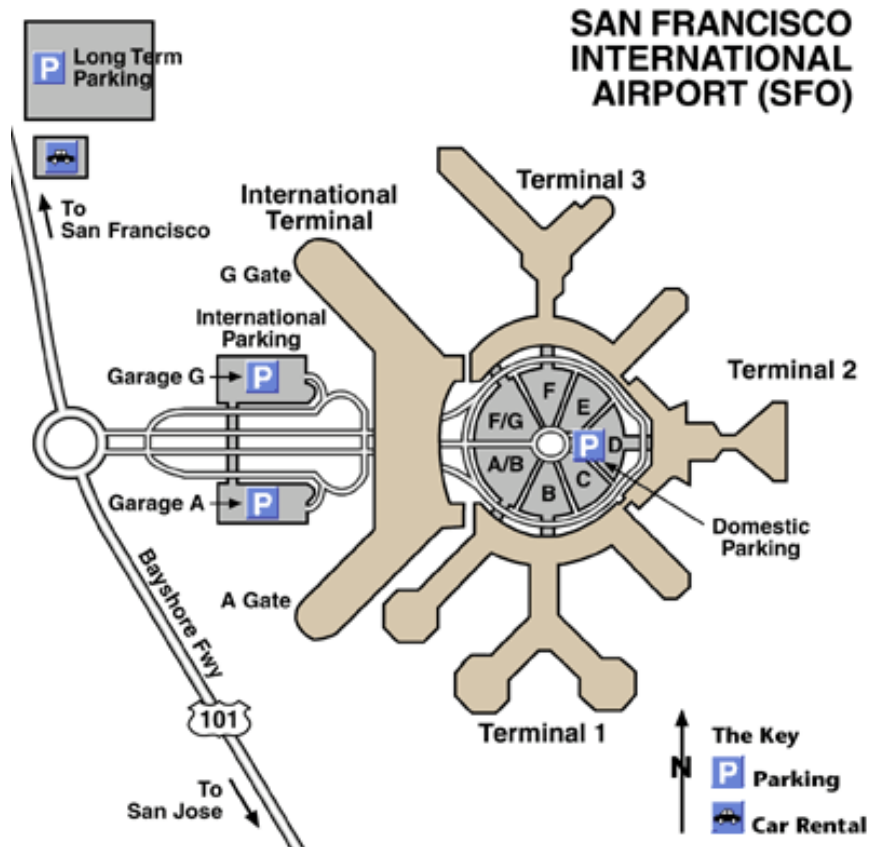
## ***Different ‘Survival’ Environments $\alpha$***

- $\alpha = 0$ 
  - Only Robustness matters for survival
- $\alpha = 1$ 
  - Only Efficiency matters
- $\alpha = 0.5$ 
  - Both matter equally
- Other  $\alpha$  values are possible



**(a) Star (b) Line (c) Circle (d) Triangular Hub (e) Pentagonal Hub (f) Perfect Hub**

## San Francisco Airport



**Perfect Hub, Alpha = 0.5**

# ***RNEDE: Resilient Network Design Environment***

- Visualize, Create, Edit and Analyze large complex networks/graphs
- Dynamic simulation platform for the development and evaluation of methods for control of networked systems
- Object Oriented system
- Prototype version in Python

## ***RNEDESIm: A Simulator for Resilient Network Design***

- Key Features

- Replays various threat and disruption scenarios
- Suggests various remedial options
- Provides a visual guide of the network
- Scalable for large networks consisting of thousands of nodes and edges
- Application-independent

- Topology  $T = (V, E)$
- $T$  satisfies set of constraints  $C = \{c_1, \dots, c_n\}$
- Cost function for maintaining  $T$ ,  $S : T \rightarrow R^+$
- Set of incidents (disruptions),  $I = \{i_1, \dots, i_n\}$
- Compromised topology,  $T' = (V', E')$  or  $(V, E')$  or  $(V', E)$ ; May not satisfy  $C$
- Amount of compromise:  $F : (T, T') \rightarrow R^+$
- Set of remedial actions,  $A = \{a_1, \dots, a_n\}$ , and a cost function,  $Q : A \rightarrow R^+$

## ***Resilient Control of Topology***

Obtain a set of remedial actions such that the compromise is minimized

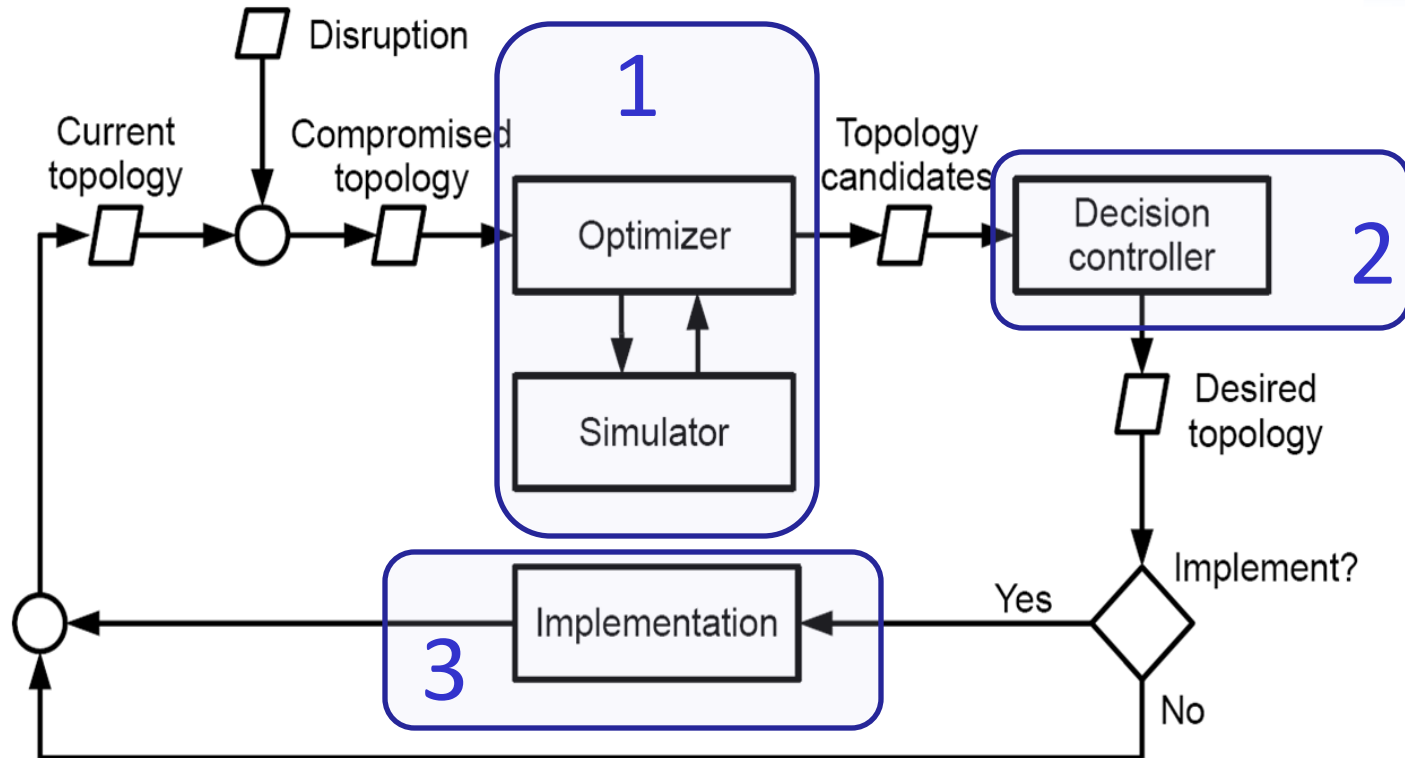
$$\text{i.e., } F(T'', T) < \epsilon$$

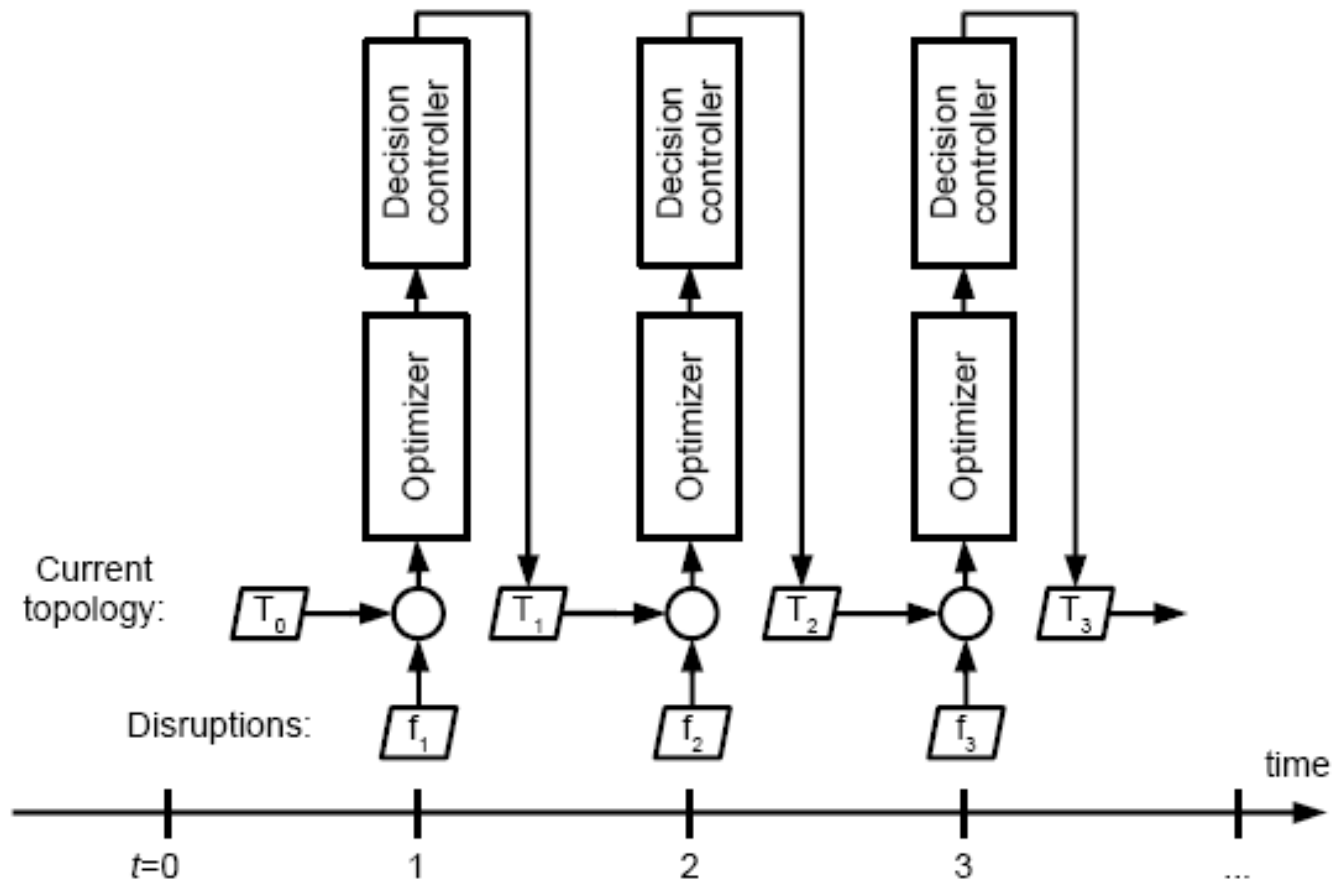
Given the disruptions, minimize the cost of maintaining the compromised topology and the cost of making the change



- **Optimizer:** Minimizes the difference in the value of the objective function,  $F$ , on the original topology and the compromised topology by choosing a set of remedial actions
- **Simulator:** Given a network specification, it calculates the value of the objective function  $F$

# RNEDE Architecture

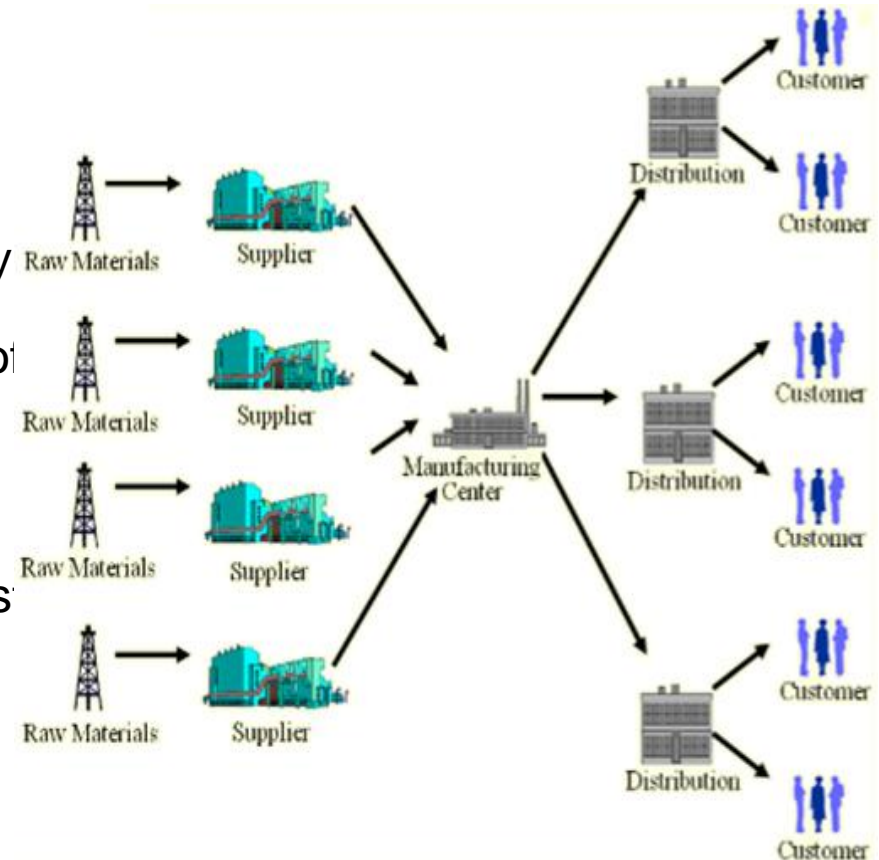




- Determines if it is beneficial to transition to  $T''$  or remain in  $T'$
- The decision is based on
  - the incoming sequence of disruptions,
  - the transition cost
    - associated with remaining in the current topology and the cost of transitioning between  $T'$  and  $T''$ .
- Adopts a rent-vs-buy model
  - staying in the current topology corresponds to renting and moving to another topology corresponds to buying
  - Several known algorithms, greedy and worst-case.

## A Case Study: Supply Chain Networks

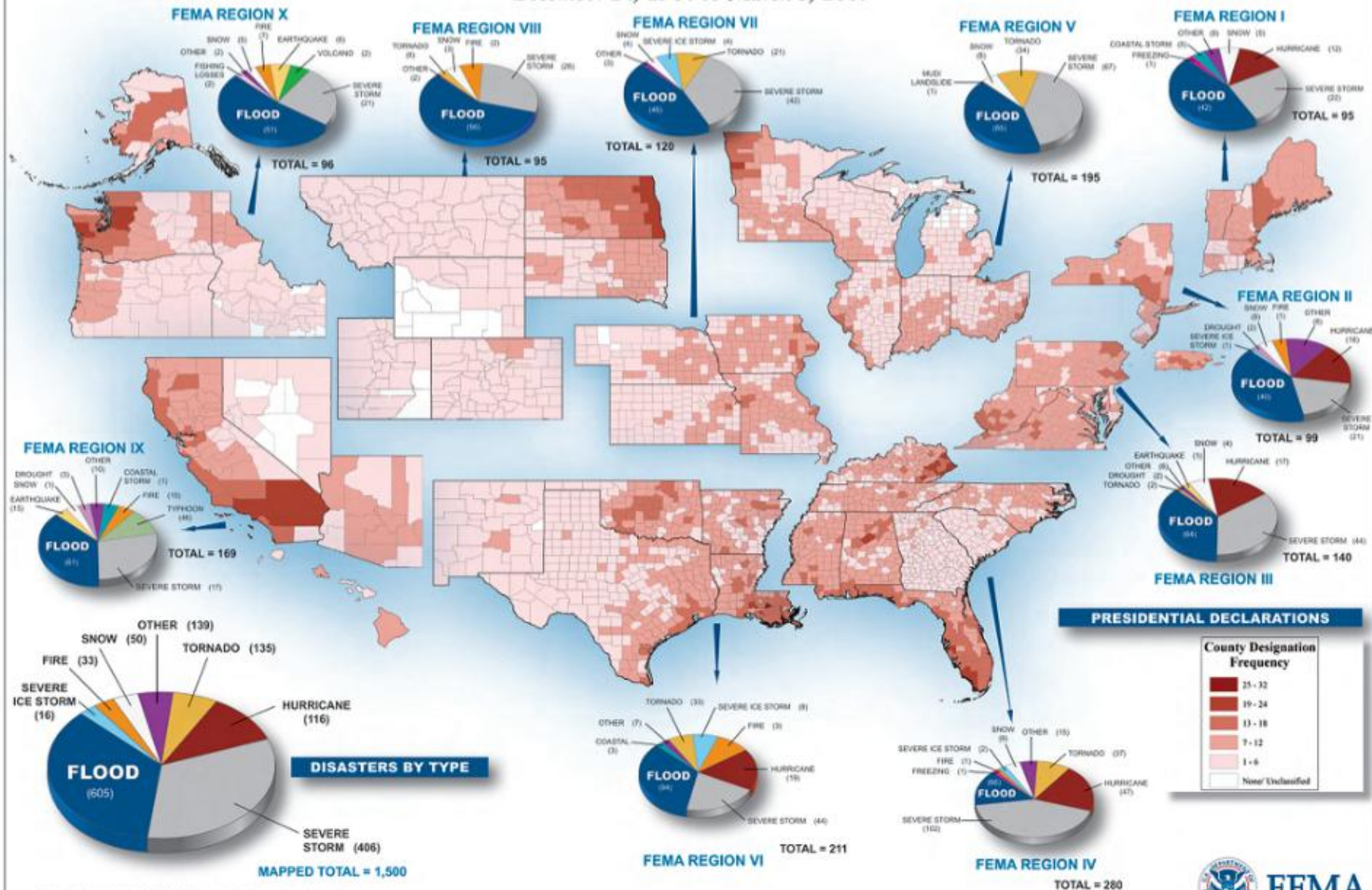
- Supply chain involves both flow of physical products and information
- Conventional objective for supply chain network design is optimizing efficiency (fulfillment of objective with minimum cost)
- A crucial objective is the maximization of robustness: the ability of the supply chain to resist shocks





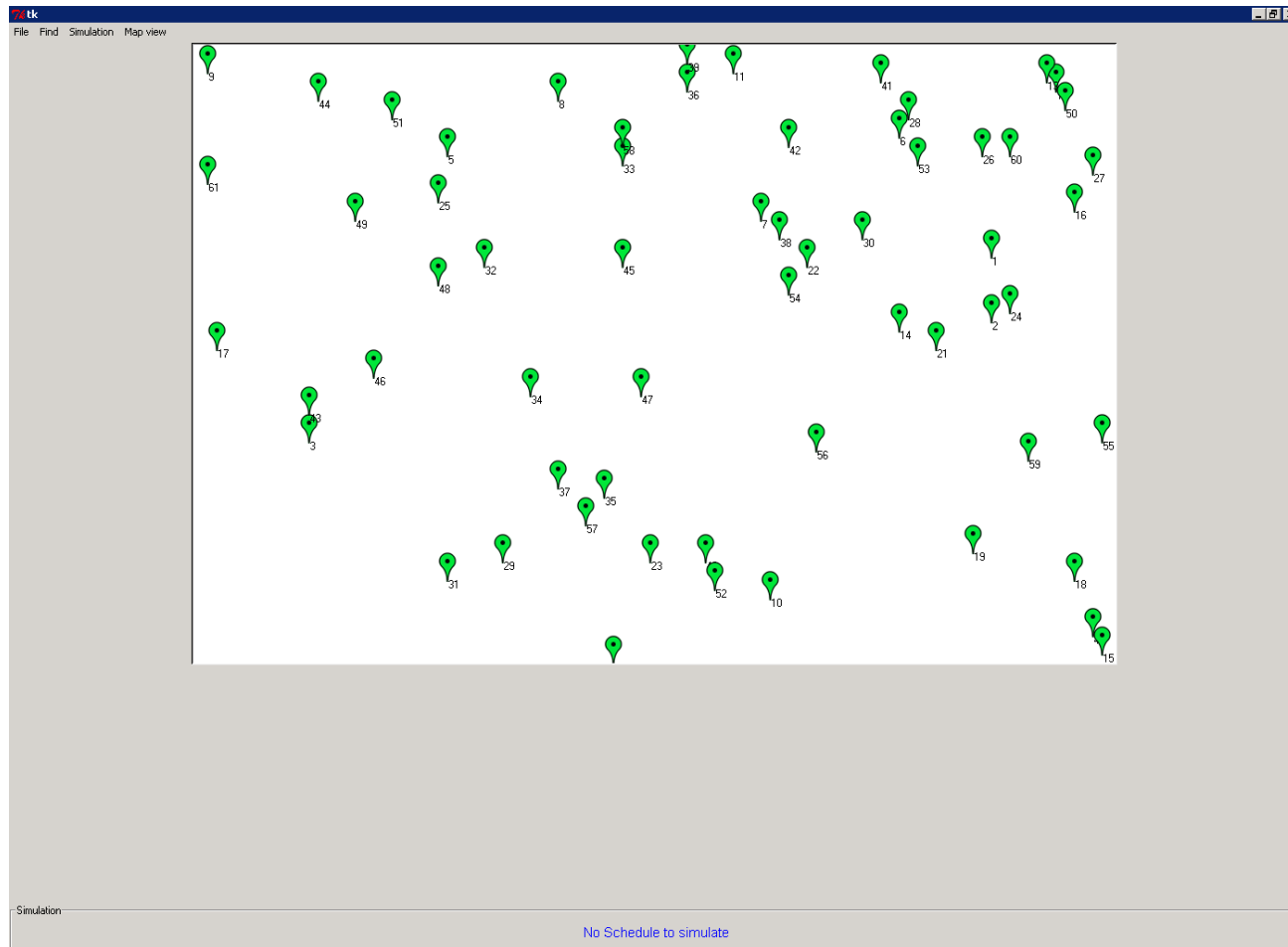
# PRESIDENTIAL DISASTER DECLARATIONS

December 24, 1964 to March 3, 2007



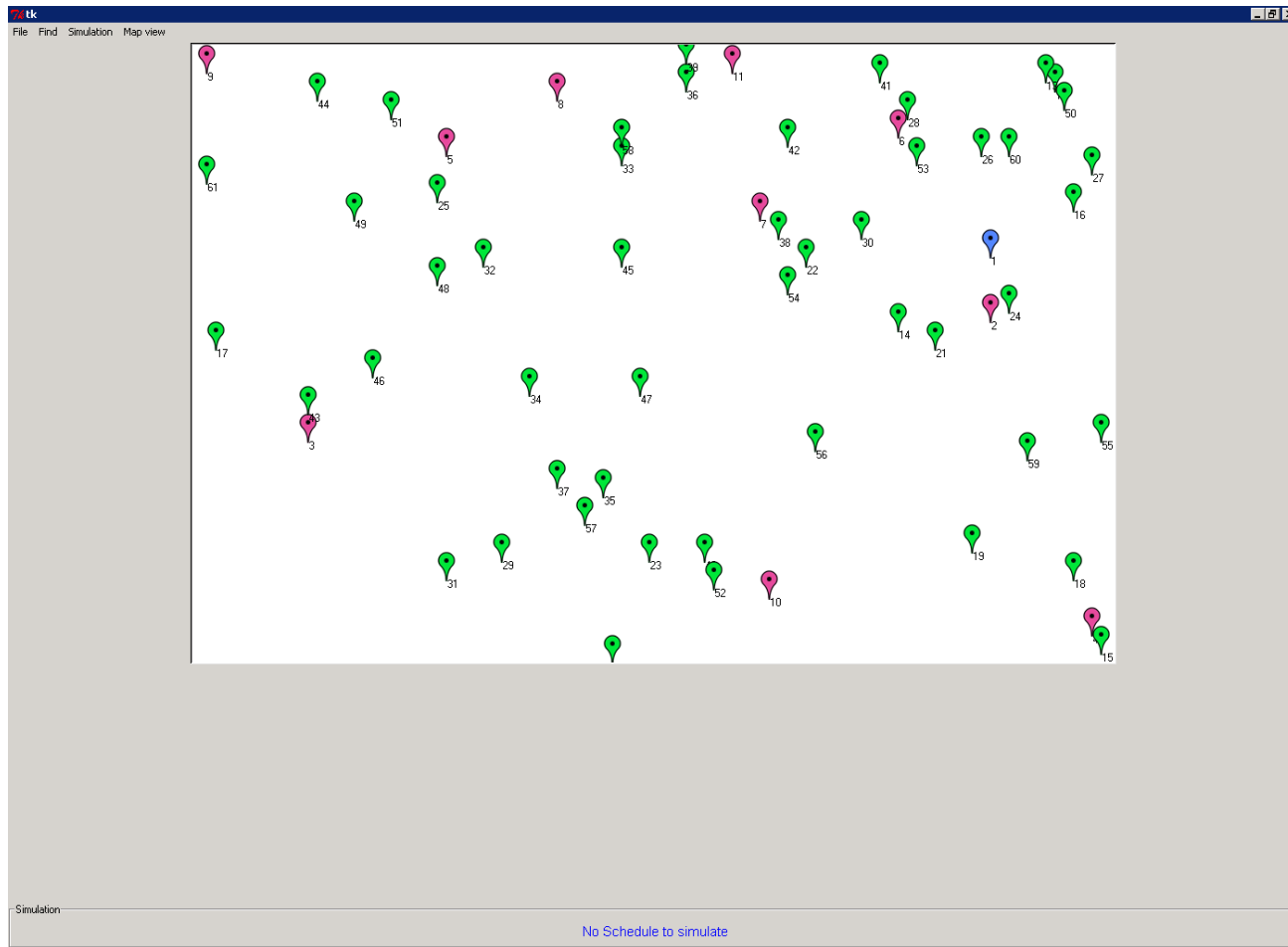
\* Prior to December 24, 1964, 179 declarations did not have county designations. Therefore, of the total declared disaster (1,500), only 1,321 are included in the Mapped Total.

- 1 Manufacturing Centre in Detroit
- 50 Customer Zones (US States)
  - Delivery to State Capitals
- 10 candidates for warehouse locations:
  - One in each FEMA region
  - Boston, NYC, Philadelphia, Jacksonville, Chicago, Houston, Kansas City, Denver, LA, Seattle
- Demand for each state proportional to the state population
- The distance between the manufacturing centers, warehouses and customer zones is road distance from Google<sup>TM</sup> Maps

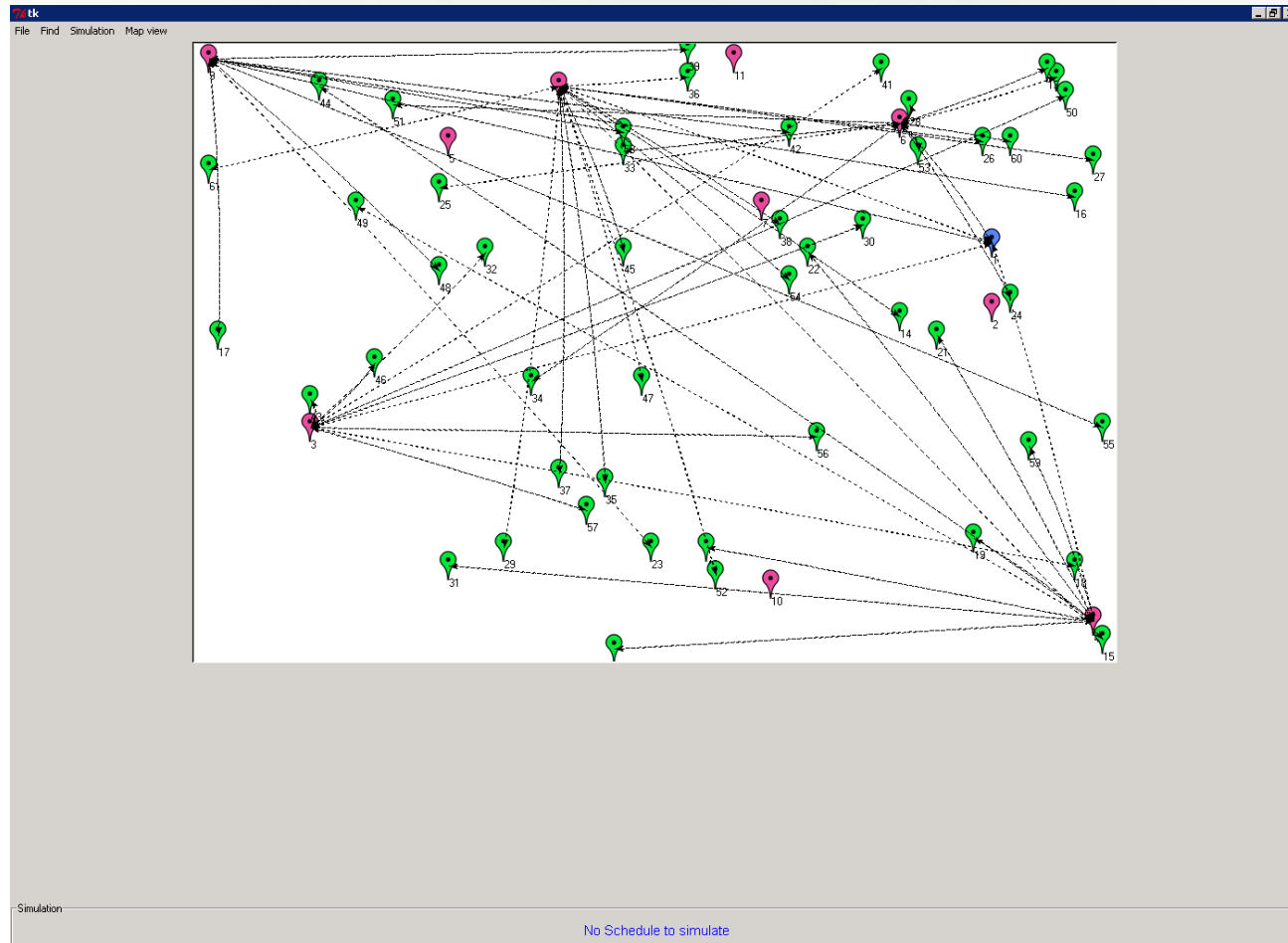




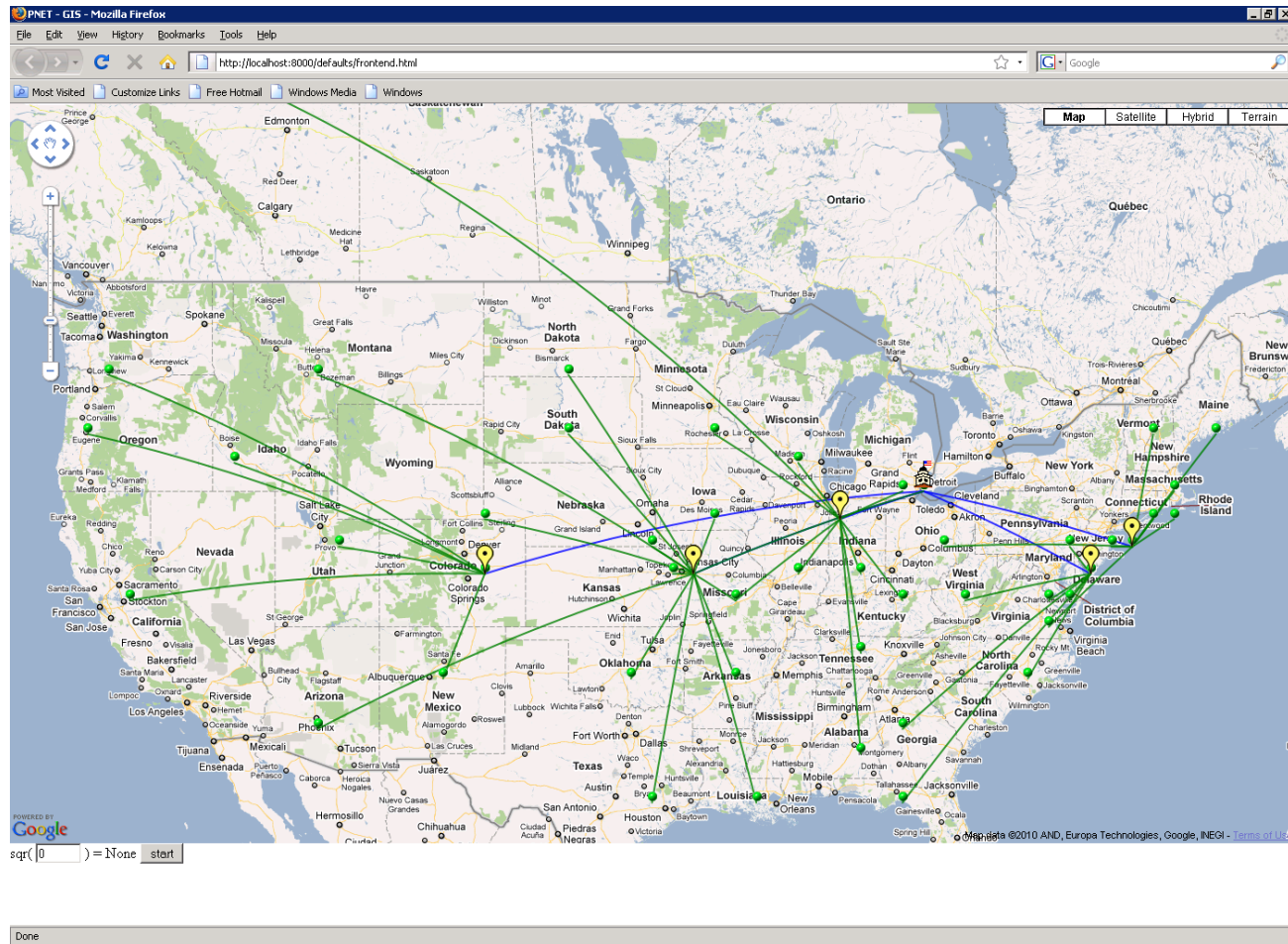
# RNEDESim: Producers/Consumers



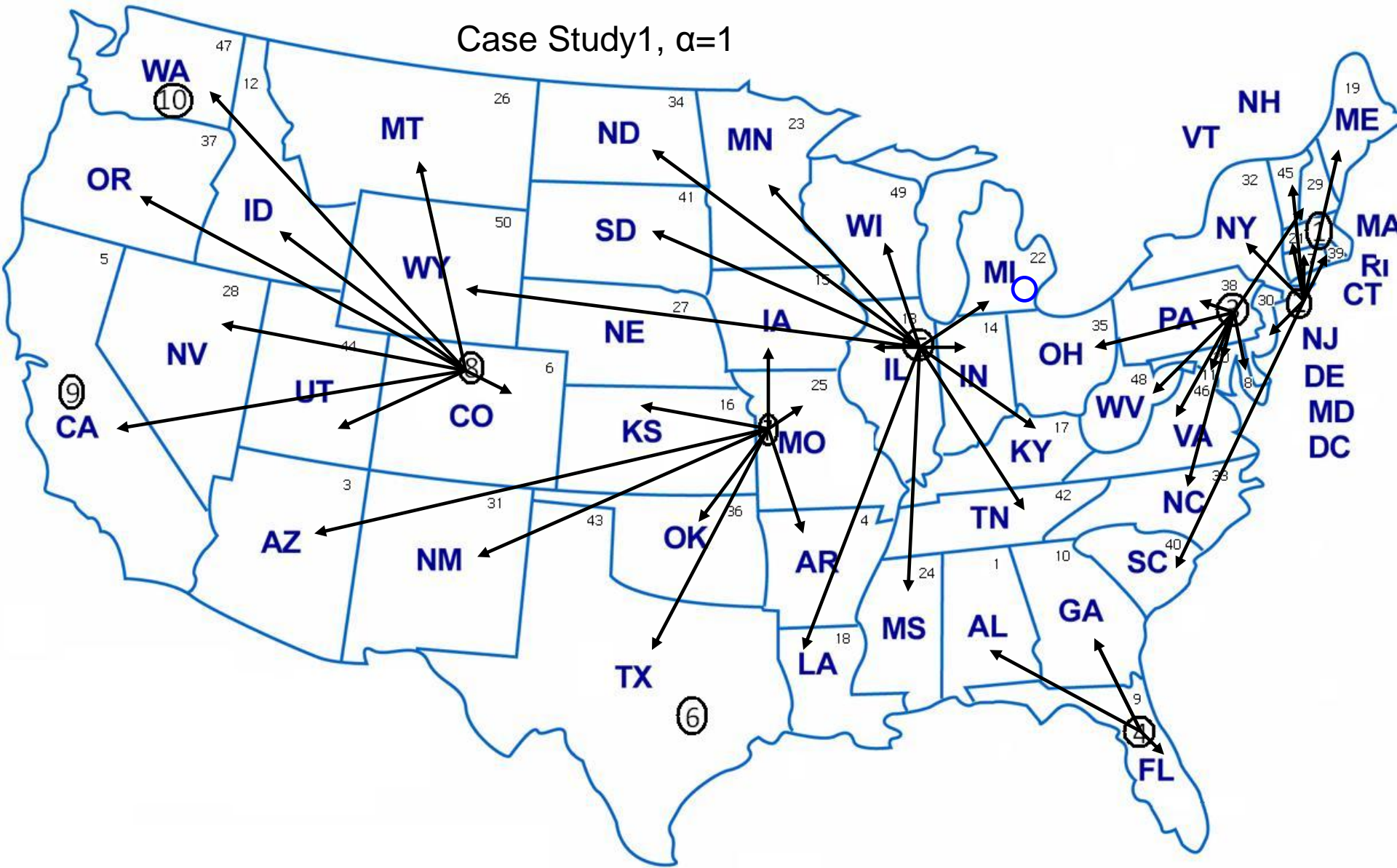
# RNEDESim: Optimized



# RNEDESim: View on the Map



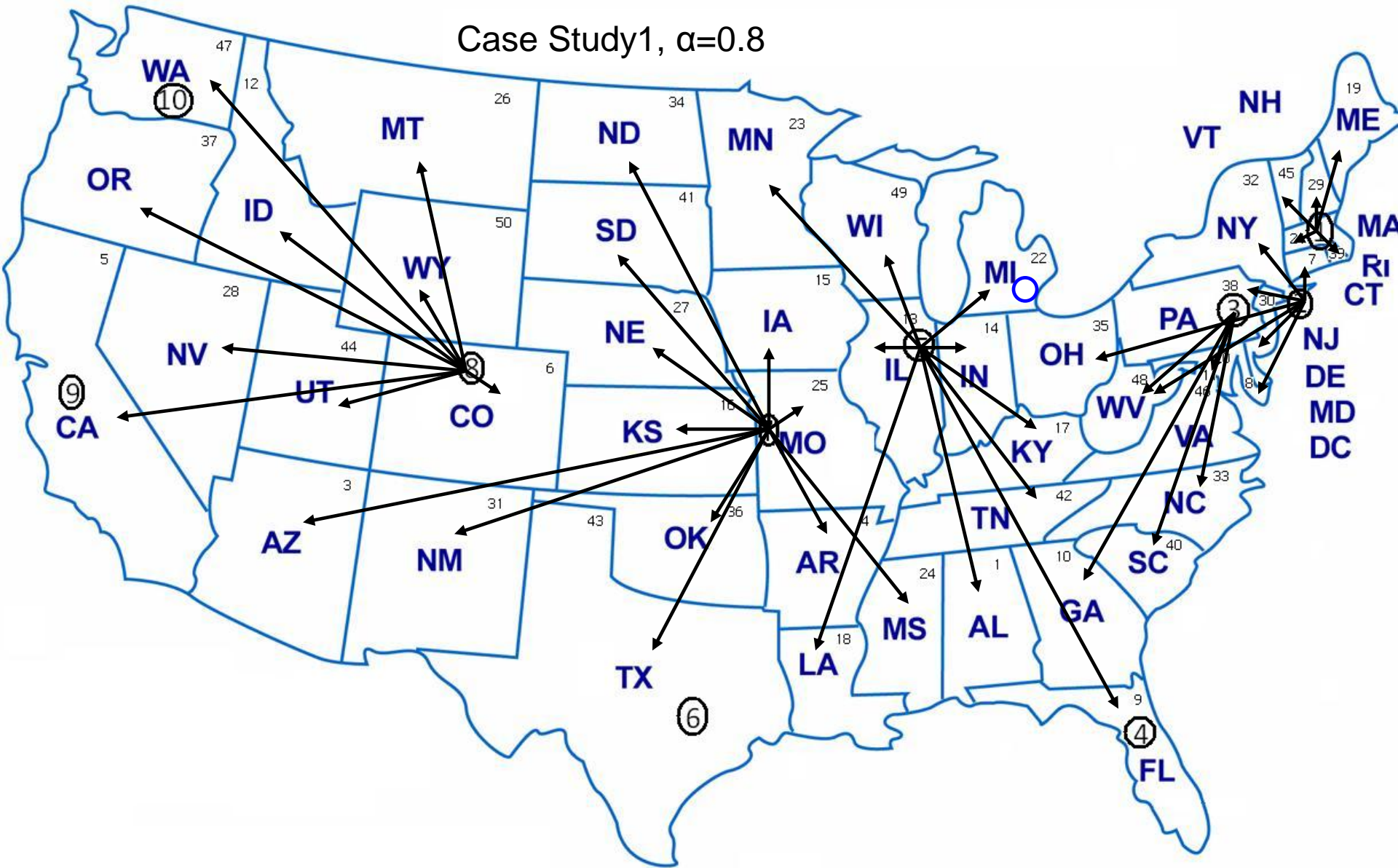
## Case Study1, $\alpha=1$



<u>Jacksonville</u>	Houston	<u>Chicago</u>	Los Angeles	<u>Philadelphia</u>	<u>Kansas City</u>	<u>New York</u>	Seattle	Boston	<u>Denver</u>
<u>12.49%</u>	9.41%	<u>8.70%</u>	7.54%	<u>6.33%</u>	<u>5.35%</u>	<u>4.42%</u>	4.28%	4.24%	<u>4.24%</u>

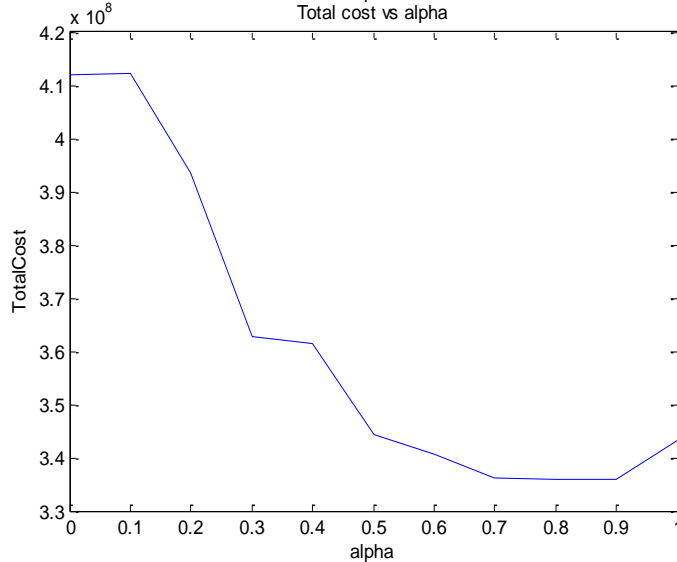
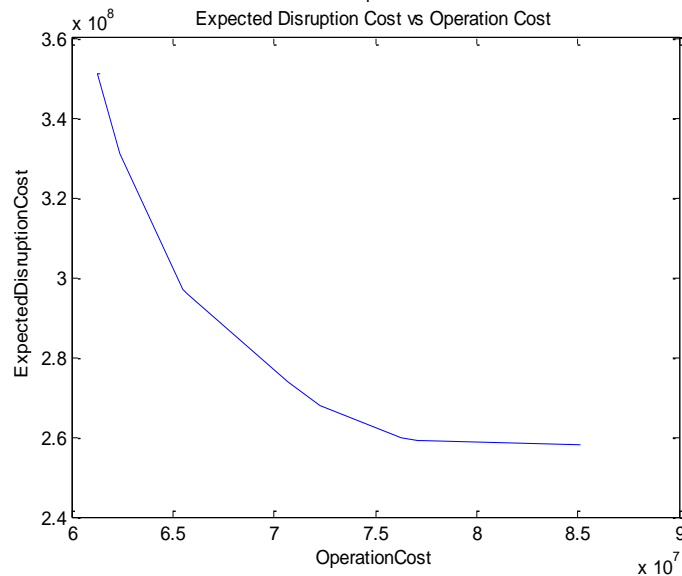
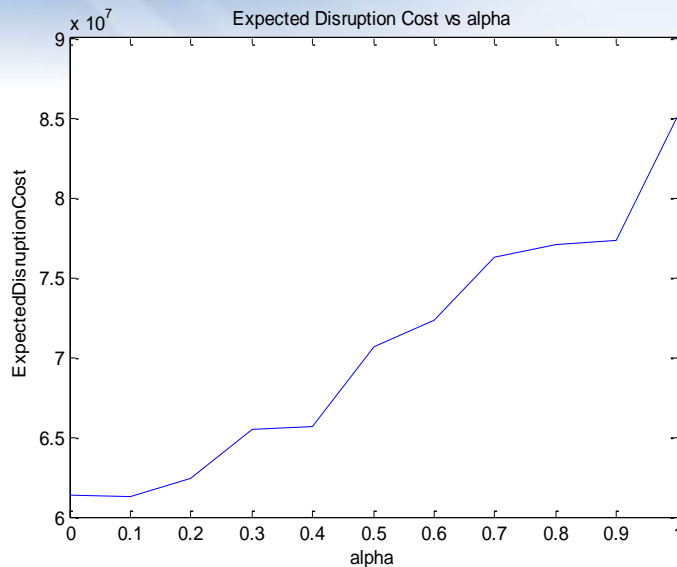
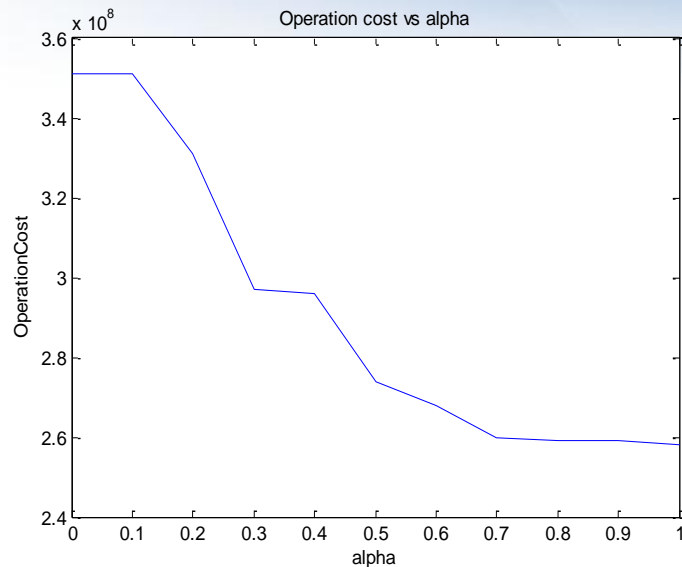


# Case Study1, $\alpha=0.8$



Jacksonville	Houston	<u>Chicago</u>	Los Angeles	<u>Philadelphia</u>	<u>Kansas City</u>	<u>New York</u>	Seattle	<u>Boston</u>	<u>Denver</u>
12.49%	9.41%	<u>8.70%</u>	7.54%	<u>6.33%</u>	<u>5.35%</u>	<u>4.42%</u>	4.28%	<u>4.24%</u>	<u>4.24%</u>

# EDC and OC Trade-offs: High Volume Low Profit



## *Summary*

- Resilient Network Design Environment
- Trade-offs between efficiency and robustness and their connection to topologies
- Re-optimize the topology when subject to disruptions for resilient control
- Python and GAMS
- Resilient Supply Chain Case Study